

1    **Longitudinal Study on Shiga Toxin–producing *Escherichia coli* and *Campylobacter jejuni***  
2    **on Finnish Dairy Farms and in Raw Milk**

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16    Running Head: STEC and *C. jejuni* on Dairy Farms and in Raw Milk

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23 **Abstract**

24 Shiga toxin-producing *Escherichia coli* (STEC) and *Campylobacter jejuni* are notable  
25 health hazards associated with the consumption of raw milk. These bacteria may colonize the  
26 intestines of asymptomatic cattle and enter bulk tank milk via fecal contamination during  
27 milking.

28 We studied the frequency of STEC O157:H7 and *C. jejuni* contamination in tank milk  
29 (n=785) and the in-line milk filters of milking machines (n=631) versus isolation from cattle  
30 feces (n=257) on three Finnish dairy farms for one year. Despite simultaneous isolation of STEC  
31 O157:H7 (17%) or *C. jejuni* (53%) from cattle, these bacteria were rarely isolated from milk  
32 filters (2% or <1%, respectively) and milk (0%). As revealed by phylogenomics, one STEC  
33 O157:H7 strain was detected on each farm at a time and persisted for  $\leq 12$  months despite  
34 rigorous hygienic measures. *C. jejuni* strains of a generalist sequence type (ST-883 and ST-1080)  
35 persisted in the herds for  $\geq 11$  months, and several other *C. jejuni* types were detected  
36 sporadically.

37 The *stx* gene carried by STEC was detected more frequently from milk filters (37%) than  
38 from milk (7%), suggesting milk filters to be more suitable sampling targets for monitoring than  
39 milk. A questionnaire of on-farm practices suggested lower *stx* contamination of milk when  
40 major cleansing in the barn, culling, or pasturing of dairy cows were applied, while higher  
41 average outdoor temperature was associated with higher *stx* contamination. Because pathogen  
42 contamination occurred despite good hygiene, and pathogen detection from milk and milk filters  
43 proved challenging, we recommend heat treatment for raw milk before consumption.

## 44 **Importance**

45       The increased popularity of raw milk consumption has created demand for relaxing  
46 legislation, despite the risk of contamination by pathogenic bacteria, notably STEC and *C. jejuni*.  
47 However, the epidemiology of these milk-borne pathogens on the herd level is still poorly  
48 understood, and data are lacking on the frequency of milk contamination on farms with cattle  
49 shedding these bacteria in their feces. This study suggests that (i) STEC contamination in milk  
50 can be reduced, but not prevented, by on-farm hygienic measures while fecal shedding is  
51 observable, (ii) milk filters are more suitable sampling targets for monitoring than milk, although  
52 pathogen detection from both sample matrices may be challenging, and (iii) STEC and *C. jejuni*  
53 genotypes may persist in cattle herds for several months. The results can be utilized in  
54 developing and targeting pathogen monitoring and risk management on the farm level and  
55 contributed to the revision of Finnish legislation in 2017.

## 56 **Introduction**

57 Raw cow milk consumption has become more popular in recent years, especially among urban  
58 consumers, creating demand for relaxing the legislation restricting raw milk sales (1–3).  
59 Releasing the sales of raw milk challenges food safety management through the milk production  
60 chain, which has relied on pasteurization to eliminate pathogenic bacteria. Related to the  
61 consumption of unpasteurized milk, Shiga toxin-producing *Escherichia coli* (STEC) and  
62 thermophilic *Campylobacter* spp., predominantly *C. jejuni*, have been regarded as the most  
63 notable health hazards, along with *Salmonella* spp. (1, 2). These pathogens have caused several  
64 milk-borne disease outbreaks, and appear to be prevalent in cattle (3). Both STEC and *C. jejuni*  
65 are carried by asymptomatic cattle in their intestines and shed intermittently into the feces (4, 5).  
66 These pathogens may therefore enter milk via fecal contamination during milking. As suggested,

67 pathogen contamination of milk may be reduced by good farming practices and milking hygiene,  
68 but not prevented completely (6).

69 To evaluate the risk of STEC and *Campylobacter* infection related to the consumption of  
70 raw milk, previous studies have investigated the prevalence of STEC and thermophilic  
71 *Campylobacter* spp. in bulk tank milk. In addition, in-line milk filters of milking machines have  
72 been studied as indicators for milk contamination by STEC and *Campylobacter* spp. because all  
73 the milk entering the tanks passes through them. A recent meta-analysis estimated mean  
74 prevalences of 1.54% for *Campylobacter* spp. in bulk tank milk and 1.75% in milk filters,  
75 considering previously published data from North America, Europe, and New Zealand (7).  
76 However, reported prevalences varied notably between various studies and regions. According to  
77 the global review by Farrokh et al. (4), isolation rates of 0–2% have typically been reported for  
78 STEC from raw milk. However, high prevalence of *stx* genes, as indicators for STEC  
79 contamination, have been reported from both bulk tank milk (15.2%) and milk filters (51.0%),  
80 highlighting the higher sensitivity of molecular detection compared to culture methods (8).

81 Despite numerous prevalence studies of STEC and thermophilic *Campylobacter* spp. in  
82 milk and milk filters, few studies have concentrated on the herd-level epidemiology of these  
83 milk-borne pathogens (9–12). Moreover, limited longitudinal data have been published on milk  
84 contamination on farms with cattle shedding these pathogens in their feces. As pathogen  
85 contamination of milk is expected to occur sporadically, frequent sampling is required to detect  
86 contamination events and draw conclusions on their frequency. In addition, detection of dilute  
87 pathogen contamination in large volumes of bulk tank milk poses a challenge, which likely  
88 necessitates several subsamples (13). Previous herd-level studies have analyzed a maximum of  
89 two milk subsamples once per month (9–12).

90 To avoid the aforementioned pitfalls in our present study, three dairy farms with  
91 previously detected carriage of STEC O157:H7 and *C. jejuni* were sampled for a period of one  
92 year: weekly for in-line milk filters and five subsamples of bulk tank milk and monthly for feces  
93 and the farm environment. We aimed to determine (i) the frequency of milk contamination by  
94 STEC O157:H7 and *C. jejuni* and associate the occurrence of milk contamination with fecal  
95 shedding of these pathogens. We compared (ii) bulk tank milk and milk filters as sampling  
96 targets for monitoring these pathogens. We investigated (iii) the genomic variation of STEC  
97 O157:H7 and *C. jejuni* isolates to recognize on-farm persistence and contamination routes.  
98 Finally, (iv) on-farm practices were investigated, aiming to recognize risk factors for milk  
99 contamination.

## 100 Results

101 **STEC O157:H7 was isolated from cattle feces on all three farms and infrequently**  
102 **from the barn environment.**

103 Fecal samples from both milking cows and juvenile cattle were collected on three dairy  
104 farms between January 2014 and June 2015. Fecal carriage of STEC O157:H7 had been detected  
105 on the farms years or months before the commencement of our study, and since the initial  
106 detection the farms had implemented intensive hygienic measures to reduce the pressure for  
107 fecal-oral transmissions.

108 STEC O157:H7 was isolated from cattle feces (17%) on each farm (1–40%) during the  
109 study (Table 1, Table 2). The isolation rate was higher on farms 2 and 3 with more recently  
110 observed carriage. On farm 1, STEC O157:H7 was only isolated from juvenile cattle in  
111 September 2014. On farm 2, the isolation rate of STEC O157:H7 from cattle feces gradually  
112 decreased since the commencement of the study, from 92% to 0% between March and July, and

113 no positives were detected after six months (September 2014). On farm 3, STEC O157:H7 was  
114 detected in 20–50% of the fecal samples from juvenile cattle at the commencement of the study  
115 (February–May) and in 100% of the fecal samples from milking cows two months later, in July  
116 2014. STEC O157:H7 was infrequently isolated from drinking troughs: 0–6% of the samples  
117 tested positive on each farm (Table 1). Drinking water was only sampled on farm 1, and STEC  
118 O157 was not detected.

119 **STEC non-O157 were isolated from cattle feces on farms 2 and 3.**

120 In addition to STEC O157, the feces were cultured for other STEC serogroups, if  
121 these serogroups (O157:H7, O26, O103, O145, O111, O121, and O45) were first detected in  
122 PCR screening from the milk or milk filters, as was the case on farms 2 and 3. The farms were  
123 monitored for other STEC serogroups to evaluate the influence of these serogroups on the PCR  
124 results, as PCR cannot distinguish whether *stx* signals arise from STEC O157. Isolates of other  
125 serogroups were also occasionally recovered in conjunction with the attempted isolation of  
126 O157.

127 On farm 2, STEC O15:H16 was sporadically isolated from the feces of milking cows in  
128 May 2015. No additional serogroups were isolated, albeit the cattle were examined by culture for  
129 STEC O103 in March and April 2014 and for O121, O145, O26, and O45 in May 2015. On farm  
130 3, STEC O26:H11 was isolated from cattle feces during four samplings between August 2014  
131 and June 2015 and once from the drinking troughs (Table 2). STEC O84:H2 was sporadically  
132 isolated from milking cows in October 2014. None of the STEC serogroups O103, O121, O45,  
133 and O145 were isolated from cattle feces in May 2015.

134 **STEC was seldom isolated from milk or milk filters on farms 2 and 3.**

135 STEC O157:H7 was seldom isolated from milk filters: 2% of the samples tested positive  
136 (0–3% on each farm) (Table 1, Figure 1). Culture-positive milk filters were only observed on  
137 farms 2 and 3, and only simultaneously with fecal isolation from milking cows. No STEC O157  
138 isolates were obtained from milk.

139 In addition to O157, other STEC serogroups were also studied using a culture method  
140 during each sampling and other STEC serogroups were isolated from milk (<1%) and milk filters  
141 (1%) during the study (Table 1, Figure 1). On farm 2, STEC O182:H25 was isolated once from  
142 milk filters in October 2014. On farm 3, STEC O121:H19 was isolated once from milk in July  
143 2014 and STEC O26:H11 from five milk filter samples in July–October 2014. Altogether, STEC  
144 of any serogroup was isolated from milk filters in 13 (8%) samplings, and only in four samplings  
145 were isolates recovered from more than one milk filter sample.

146 **Milk filter samples tested PCR positive for *stx* more frequently than milk.**

147 All milk and milk filter samples were screened for the virulence genes *stx* and *eae* by  
148 PCR. *Stx* was infrequently detected from milk: 7% of the subsamples tested positive (3–10% on  
149 each farm) (Table 1, Figure 1). Altogether, *stx* was detected from milk in 30 (19%) samplings  
150 (12–27% on each farm). Of these 30 samplings, only one subsample tested positive in the  
151 majority (57%) of samplings, and three or more subsamples in 20% of the samplings. In 90% of  
152 the 30 samplings, the milk filter samples also tested *stx* positive.

153 Milk filter samples tested positive for *stx* (37%) more frequently than milk subsamples  
154 (7%) (Table 1, Figure 1). *Stx* was detected from milk filters in 91 (58%) samplings (29–86% on  
155 each farm). In 30% of these 91 samplings, *stx* was also detected in the milk subsamples. Overall,  
156 *stx* prevalence appeared 5.6-fold (4.3–6.0 on each farm) higher in milk filter samples than in

157 milk subsamples, with an odds ratio of 8.3 (95% confidence interval: 6.0–11.5) for higher  
158 prevalence in milk filters. Samplings with *stx*-positive milk filter samples occurred 3.1-fold more  
159 often than samplings with *stx*-positive milk samples, with an odds ratio of 5.9 (95% confidence  
160 interval: 3.6–9.9) for higher occurrence in milk filters.

161 **Detection rate of *stx*, *eae*, and serogroup-specific genes by PCR varied farm to farm.**

162 *Stx* and *eae* were detected from milk and milk filters also when no STEC could be  
163 isolated from cattle feces. However, farm-to-farm variation was observed: three-fold more *stx*-  
164 positive milk (7–10%) and milk filters (40–45%) were detected on farms 2 and 3 compared with  
165 farm 1 (3% and 15%, respectively), where STEC was not isolated from fecal samples of milking  
166 cows during the study (Table 1, Figure 1). On farm 1, only 29% of the *stx*-positive milk filters  
167 also tested positive for *eae*, whereas the majority of the *stx*-positive milk filters tested *eae*  
168 positive on farms 2 (76%) and 3 (91%).

169 Milk and milk filters positive for *stx* and *eae* were also PCR-screened for seven  
170 serogroups associated with the highest health risk for consumers (14). Serogroups O157:H7,  
171 O103/O145, O26, O45, and O121 were detected with PCR from milk or milk filters on farms 2  
172 and 3. No serogroup O111 was detected. Few of the examined filters, 17 (17%) and 1 (2%) on  
173 farms 2 and 3, respectively, tested PCR positive for O157:H7. STEC O157:H7 was not detected  
174 by PCR from two milk filters, despite isolates being obtained, indicating insensitivity of the PCR  
175 method for O157:H7. On farm 2, fewer (0–15%) examined milk filters (n=39) tested PCR  
176 positive for other serogroups than for O157:H7. On farm 3, a higher proportion (31–48%) of the  
177 examined milk filters (n=29) tested PCR positive for O45, O26, and O121 than for O157:H7 and  
178 the other serogroups (0–7%), congruent with the isolation of O26 and O121 from the farm.



179 **STEC isolates shared similar genetic features within a serogroup.**

180 STEC isolates were studied for serotype and the main virulence genes, and one or two  
181 isolates were subtyped per each positive sample (feces or other sample materials, respectively)  
182 by pulsed-field gel electrophoresis (PFGE). All STEC O157:H7 isolates from the three farms  
183 harbored virulence genes *stx1a*, *stx2c*, *eae*, and *hlyA*, represented clade 7 by Manning et al. (15),  
184 and were highly similar with each other in PFGE (similarity  $\geq 95\%$ , maximum difference of four  
185 bands from the predominant type). In addition, STEC O26:H11 isolates from farm 3 represented  
186 highly similar pulsotypes with each other (similarity  $\geq 95\%$ , maximum difference of two bands  
187 from the predominant type) and harbored genes *stx1a*, *eae*, and *hlyA*. Other STEC isolates were  
188 sporadic findings from farm 2 (O15:H16 harboring *stx2g* and *est1a*; O182:H25 harboring *stx1a*,  
189 *eae*, and *hlyA*) and farm 3 (O84:H2 harboring *stx2c*, *eae*, and *hlyA*; O121:H19 harboring *stx2a*,  
190 *eae*, and *hlyA*) (Table S1).

191 **Phylogenomics of STEC O157:H7 revealed persistence of one or two genotypes on**  
192 **each farm.**

193 To conclude whether one or more STEC O157:H7 genotypes persisted on the farms,  
194 phylogenomic analysis was performed for a selection of farm isolates collected both before (1–5  
195 isolates per farm) and during the study period (2–16 isolates per farm) (Table S1). Thus, the  
196 isolate selection also considered the first detection of the pathogen on the farm years or months  
197 before our study and represented all positive samplings. First, whole-genome multilocus  
198 sequence typing (wgMLST) was performed to investigate the similarity of 32 farm isolates  
199 among 482 globally collected isolates from the INNUENDO database (16), all representing  
200 sequence type (ST) ST-11 in the seven-loci multilocus sequence typing (MLST) (Data set S1). In  
201 the resulting minimum spanning tree (Fig. S1), the farm isolates grouped with other Finnish

202 isolates (from cattle, farm environments, or human clinical samples) in a separate branch from  
203 foreign isolates, and appeared to be within relatively close pairwise distances (PWDs). In the  
204 allelic profile size of 2353, the maximum PWD was 23 (1.0%) among the farm isolates, while  
205 the maximum PWD within the whole data set was 633 (27%). The closest foreign isolate,  
206 collected in UK in 2016, differed from the closest farm isolate with a PWD of 30 (1.3%) and was  
207 selected as an outgroup for further analyses.

208       Because of the high similarity between the farm isolates, their phylogeny was  
209 investigated with higher resolution by mapping the sequencing reads to a draft, in-group  
210 reference genome to determine genome-wide single nucleotide polymorphisms (SNPs). The  
211 resulting maximum likelihood tree, which considered both SNPs and invariant sites, revealed  
212 four lineages with high confidence: UFBoot bootstrapping support of 100% (Figure 2). All  
213 isolates from farm 2, collected during a 12-month period (October 2013–September 2014),  
214 clustered into one lineage. Likewise, one lineage grouped the isolates from farm 3, collected  
215 during an 11-month period (January–November 2014). The isolates of farm 1 divided into two  
216 lineages: one lineage for the isolates collected in October 2011–January 2012 and one lineage for  
217 the isolates collected more than 2.5 years later, in September 2014. Thus, a maximum 12 months  
218 of on-farm persistence was detected for STEC O157:H7 strains in our study, within the limits of  
219 sampling periods. Similar results were obtained both by including or excluding the outgroup  
220 strain from the analysis. To further date back the closest ancestor of farm 1 lineages, temporal  
221 signal and validity of the molecular clock assumption were investigated using root-to-tip  
222 analysis. No clear temporal signal was detected in this analysis ( $R^2 = 1.6 \times 10^{-3}$ ) and thus, no  
223 evolutionary dating was performed.

224 **No *C. jejuni* could be isolated from milk, although it appeared prevalent in cattle.**

225 *C. jejuni* was isolated only from one milk filter sample and not from milk in our study  
226 (Table 1). Nevertheless, *C. jejuni* was repeatedly isolated from cattle feces: 53% of the samples  
227 tested positive (16–87% on each farm). As with the fecal samples, swab samples from the  
228 drinking troughs showed farm-to-farm variation (0–18%). Drinking water was only sampled on  
229 farm 1, and no *C. jejuni* could be isolated from these samples.

230 ***C. jejuni* was isolated only in summer on farm 2, and only sporadic genotypes were**  
231 **detected.**

232 One or two *C. jejuni* isolates from each positive sample (feces or other sample materials,  
233 respectively) were subtyped by PFGE, and a representative isolate of each pulsotype was  
234 subjected to whole-genome sequencing, followed by MLST (Table S2, Fig. S2). Persistent  
235 pulsotypes detected in more than four samplings were further investigated using wgMLST.

236 On farm 2, the isolation rate of *C. jejuni* from the fecal samples of milking cows  
237 remained high ( $\geq 83\%$ ) during the warm months (May–August) and gradually decreased to 0% in  
238 winter (Table 2). Only once was *C. jejuni* recovered from the drinking troughs. The isolates  
239 represented 15 pulsotypes, which appeared in one to four temporally related samplings, and no  
240 persistent pulsotypes were recognized. Furthermore, the pulsotypes represented eleven STs (11,  
241 45, 48, 267, 677, 692, 1701, 1938, 4080, 5559, and 7435). Six farm isolates of ST-45 were  
242 further subjected to wgMLST with 436 ST-45 isolates from the INNUENDO database (Data set  
243 S2, Fig. S3) (17). In the allelic profile size of 654 loci, dissimilarity was observed between the  
244 isolates that were collected from farm 2 in spring and fall (PWD 44.6%) and between isolates  
245 from the three farms (PWD $\geq 3.5\%$ ), supporting sporadic findings.

246 **Both sporadic and persistent *C. jejuni* genotypes were detected on farms 1 and 3.**

247 On farm 1, the isolation rate of *C. jejuni* from cattle feces varied over time, with no  
248 recognizable trend (Table 2). The *C. jejuni* isolates represented three pulsotypes that were  
249 detected sporadically by MLST and belonged to ST-45 or ST-1080 (Table S2, Fig. S2). One  
250 pulsotype that represented ST-1080 appeared persistently in five samplings throughout year  
251 2014. Three ST-1080 isolates of farm 1, collected during an 11-month period (February–  
252 December 2014), were subjected to wgMLST and compared with four ST-1080 isolates  
253 available from the INNUENDO database (17), all originating from Finland (Data set S3, Fig.  
254 S4). In the allelic profile size of 874 loci, the isolates from farm 1 appeared within a PWD of 2  
255 (0.2%) from each other and a PWD of 22–28 (2.5–3.2%) from the other Finnish ST-1080  
256 isolates. Thus, the ST-1080 isolates of farm 1 appeared similar in wgMLST, supporting PFGE  
257 results on the persistence of a single strain.

258 On farm 3, a high proportion ( $\geq 83\%$ ) of the fecal samples from milking cows tested  
259 positive for *C. jejuni* in every sampling. In addition, *C. jejuni* could be isolated from drinking  
260 troughs (18%) in four samplings, indicating defects in the hygiene and pressure for fecal-oral  
261 transmissions. Eighteen pulsotypes were recognized among the *C. jejuni* isolates, representing  
262 eleven STs (45, 267, 538, 583, 883, 925, 991, 4080, 5559, 9407, and 9408). A majority of the *C.*  
263 *jejuni* pulsotypes appeared sporadically in one or two samplings. One pulsotype (ST-4080 in  
264 MLST) was detected in four samplings throughout the year. Furthermore, one pulsotype (ST-883  
265 in MLST) occurred persistently in each sampling after initial detection in July 2014. In addition  
266 to feces, it was recovered twice from drinking troughs and once from milk filters.

267 Five ST-883 isolates from farm 3 were further subjected to wgMLST and compared with  
268 66 ST-883 isolates of global origin from the INNUENDO database (Data set S4, Fig. S5). Farm

269 3 isolates had been recovered during an 11-month period (July 2014–May 2015) and appeared  
270 within a PWD of 1 (0.1%) from each other in the allelic profile size of 801 loci. Overall, the  
271 maximum PWDs within all 71 isolates was 285 (36%) and the closest other isolates (from  
272 Austria) were within PWDs of 14–15 (1.7–1.9%) from the isolates of farm 3. Results obtained by  
273 wgMLST indicated a high similarity between the ST-883 isolates from farm 3, thus supporting  
274 PFGE results on persistence.

### 275 **On-farm practices and temperature affected *stx* contamination of milk.**

276 To recognize risk factors for milk contamination, we investigated the effect of on-farm  
277 practices, meteorological factors, and hygiene indicators on *stx* contamination of milk using a  
278 logistic regression model with nine explanatory variables (Table 3). *Stx* contamination of milk  
279 was reduced by three on-farm practices: removal of milking cows from the herd by culling  
280 (variable ‘*Sale*’), major cleansing in the barn (variable ‘*Cleanse*’), and pasturing of milking cows  
281 (variable ‘*Pastured*’). Average outdoor temperature (variable ‘*Temp*’) weakly increased milk  
282 contamination (95% credibility interval: 0.49–1.25). However, mild correlation (Pearson  
283 coefficient 0.6) was observed between temperatures (*Temp*) and pasturing (*Pastured*) in the data  
284 exploration, which could have weakened the observed effects of these variables.

285 No effect on *stx* contamination of milk was observed for five variables: abnormalities in  
286 feed (variable ‘*Feed*’), maintenance of the milking equipment (variable ‘*Maint*’), rainy days as  
287 an indicator of humidity (variable ‘*Rain*’), total bacterial counts (variable ‘*Bact*’), and somatic  
288 cell counts (variable ‘*Cell*’). However, maintenance of the milking equipment (*Maint*) possibly  
289 reduced milk contamination (95% credibility interval: -2.76–0.07), but exceeded the tolerance  
290 limit for uncertainty, and thus reliable conclusions cannot be drawn.

## 291 Discussion

292 We studied the occurrence of STEC O157:H7 and *C. jejuni* in cattle feces to evaluate the  
293 contamination pressure on milk on three farms with previously detected carriage of these  
294 pathogens. Since the first detection of STEC O157:H7 years or months before our study, the  
295 farms had followed national policies and implemented rigorous hygienic measures to reduce  
296 environmental contamination, and thereby, fecal-oral transmissions. Therefore, these measures  
297 could have reduced the fecal prevalence over months and contributed to the variation observed  
298 between the samplings and farms, although the observed variation could also have been due to  
299 naturally intermittent fecal shedding. Previous reports have suggested the effect of on-farm  
300 practices on STEC, but not on *C. jejuni* (18, 19). Fecal shedding of STEC O157:H7 and *C. jejuni*  
301 was at least intermittently observed on each farm during the study, introducing a contamination  
302 pressure on milk via feces.

303 STEC O157:H7 was isolated from milk filters only simultaneously with the fecal  
304 isolation from milking cows, and no isolates were recovered from milk. However, other STEC  
305 serogroups were additionally isolated from the farms and could have contributed to the rate of *stx*  
306 detection. The detection of *stx* and serogroup-specific genes in milk and milk filters reflected the  
307 on-farm rate of STEC isolation from the feces of milking cows and serogroups of the isolates,  
308 suggesting that PCR results from milk and milk filters were associated with fecal shedding. We  
309 observed lower detection rates for *stx* and *eae* and no serogroup-specific genes on farm 1, where  
310 no STEC was isolated from cow feces. Positive PCR results in the absence of culturable STEC  
311 suggest shedding of the pathogen at levels below the detection limit of culture methods,  
312 intermittent shedding that was not captured by monthly samplings, or the presence of free-  
313 floating *stx*-converting bacteriophages (20). Because *stx* signals may arise from free phage

314 particles, *eae* signals from enteropathogenic *E. coli* and other species, and serogroup-specific  
315 genes from non-pathogenic *E. coli* (14), PCR cannot confirm the presence of viable STEC  
316 isolates that harbor these genes. However, high prevalence of *stx* phages in the farm environment  
317 could pose a risk for new STEC pathotypes by transduction (20). Overall, any STEC should be  
318 considered a potential pathogen to humans, as novel pathogroups may arise from the  
319 rearrangements of virulence features due to high genomic plasticity (21).

320         Detection of STEC O157:H7 in cattle feces decreased below the detection limit on all  
321 three farms during the study period. The isolates represented clade 7, which has been associated  
322 with less severe disease and with environmental fitness that likely facilitates O157:H7  
323 colonization of bovines (15, 22). As revealed by phylogenomic analysis, only one STEC  
324 O157:H7 lineage was detected on each farm at a time and they persisted for up to 12 months  
325 after first detection. On farm 1, the detection of two lineages, sampled more than 2.5 years apart,  
326 suggested re-introduction of STEC O157:H7 to the herd after months of negative detection,  
327 assuming that the analyzed isolates (n=7) well-represented the on-farm genomic variation.  
328 Similarly, Worley et al. (23) found only one or two genomic lineages of STEC O157:H7 within  
329 herds in California regardless of the isolation rate, and they observed on-farm persistence of a  
330 lineage for 11 months. In our study, origin and source of the presumably new farm 1 strain was  
331 not investigated, but the results of wgMLST indicated a domestic origin: the strain grouped with  
332 other Finnish isolates, which mainly sourced from cattle, farm environments, or human clinical  
333 samples. Transmission from drinking water, purchased cattle, or feed was excluded because  
334 STEC was not detected from the water samples and all new animal material was raised and  
335 silage produced on-farm. In general, STEC survives in the environment and effluents for long

336 periods of time, and can be transmitted to cattle via animal vectors such as wildlife and pests  
337 (24).

338 In contrast to STEC O157:H7, *C. jejuni* was repeatedly isolated from cattle feces on all  
339 three farms, but sparsely detected in milk and milk filters. Despite hygienic measures,  
340 persistence of *C. jejuni* was observed on two farms for at least 11 months, and sporadic strains  
341 were detected on all three farms. As suggested (25), certain *C. jejuni* genotypes have adapted and  
342 circulate within farm environments, but cannot outcompete other genotypes as several genotypes  
343 are observed simultaneously within a herd. Furthermore, generalist genotypes that infect multiple  
344 animal species occur in agricultural environments, whereas genotypes in wildlife show more  
345 host-specificity. On farm 2, high occurrence of sporadic *C. jejuni* only in summer suggest that  
346 transmissions originated from the surrounding environment outside of the frost season  
347 (November–February). Pasturing in a bird-rich area may have contributed to the short-term  
348 colonization of animals by *C. jejuni*, although transmissions between cattle and wild birds are  
349 controversial (25–27). Persistence of two *C. jejuni* genotypes, namely ST-1080 (no CC  
350 designation by the time of writing) and ST-883 (ST-21 CC), were observed on farms 1 and 3,  
351 respectively. Both STs and ST-21 CC have previously been found from multiple hosts  
352 (<https://pubmlst.org/campylobacter/>) (28), indicating the generalist nature of the genotypes.  
353 These genotypes could supposedly be adapted to long-term colonization of the animals or  
354 sustaining the colonization in the herd via survival in the environment better than the sporadic  
355 genotypes. Varying survival abilities of *C. jejuni* lineages have been demonstrated in sources  
356 outside the host (29, 30), but more research is needed on reservoirs and vehicles in farm  
357 environments.



358 Furthermore, we investigated the frequency of milk contamination on farms positive for  
359 STEC O157:H7 and *C. jejuni*, and compared the suitability of bulk tank milk and milk filters as  
360 sampling targets. Milk entering a tank is passed through the milk filters, which could therefore  
361 indicate contamination during milking and be used as an alternative sampling target to bulk tank  
362 milk (8, 13, 31). More frequent detection of STEC and *C. jejuni* from milk filters than milk  
363 suggests that pathogen contamination occurred during milking, but often could not be detected  
364 from the five milk subsamples. Detection was probably hindered by the low concentrations of  
365 pathogenic bacteria in the tank milk. This is supported by the observation that in the majority of  
366 samplings only one out of five subsamples tested positive. Pathogen contamination occurred  
367 despite the milk appearing of good hygienic quality, based on total bacterial counts that were  
368 usually below 50 000 cfu/mL on all three farms. No correlation between total bacterial counts  
369 and *stx* contamination of milk was observed in the statistical analysis. Similarly, Ruusunen et al.  
370 (6) observed that total bacterial counts poorly indicated pathogen contamination. However,  
371 dissimilar results on pathogen contamination of milk could have been obtained on farms with  
372 poor milking hygiene (31). Noteworthy, failure to detect small quantities of STEC and *C. jejuni*  
373 in milk could pose serious public health implications, as only a few cells may cause infection  
374 depending on strain characteristics and host susceptibility (21, 32). As one positive out of five  
375 subsamples (25 mL) corresponds to 0.0089 MPN/mL (95% confidence interval: 0.0012–0.066)  
376 (33), one glass (200 mL) of milk could cause infection with the contamination levels observed in  
377 our study.

378 As the detection of STEC from milk filters suggested, fecal contamination occurred  
379 during milking. Nevertheless, *C. jejuni* was poorly detected from milk filters and milk, despite  
380 the majority of fecal samples from milking cows testing positive. This may indicate poor

381 survival of *C. jejuni* in both milk and milk filters or an inability to detect the pathogen by  
382 standard culture methods due to sub-lethal cell damage (7, 29). Milk filter samples were  
383 analyzed 48–72 h after sampling and storage in buffered peptone water, which appeared  
384 insufficient for the detection of *C. jejuni*. As recently suggested by Artursson et al. (13), the  
385 isolation rate of *C. jejuni* from milk filters is highly affected by sampling regime and could be  
386 improved by the addition of Cary Blair transport medium. On the other hand, *C. jejuni* strains  
387 may differ in their ability to survive in raw milk, and thus pose a different risk related to the  
388 consumption of raw milk (34). Raw milk offers ideal growth conditions for bacteria due to its  
389 rich nutrients, neutral pH, and high water activity, but also exposes bacteria to environmental  
390 stresses: rich competing microbiota, bactericidal compounds, and cold storage (34, 35).  
391 Therefore, inability to proliferate in cold conditions and sensitivity to toxic derivatives formed by  
392 oxygen may hamper the survival of *C. jejuni* in raw milk (34).

393       Lastly, we investigated on-farm risk factors that could have affected milk contamination  
394 by STEC bacteria, as indicated by the presence of *stx*. Results suggest the desired effect of  
395 cleansing as a control measure. Effect of culling could be explained by variation in the fecal  
396 shedding of STEC between animals and over time, which has been studied extensively (reviewed  
397 in reference 24). Culling of a super-shedder could reduce environmental contamination and,  
398 thereby, reduce the contamination pressure on milk (12). Pasturing could decrease shedding by  
399 shifting the diet from concentrated feed to fresh grass, as concentrated feed has been reported to  
400 increase STEC shedding (24). Alternatively, lower animal density on pastures could reduce  
401 udder contamination, thus reducing the contamination pressure on milk. Average outdoor  
402 temperature was observed to increase milk contamination, concordantly with the observations of

403 higher STEC prevalence during warm months (24). With the limited data set used in our study,  
404 the results can be regarded as preliminary and should be verified with more data.

405 In conclusion, our study suggested persistence of STEC O157:H7 in the three Finnish  
406 herds for up to 12 months. Although the milk produced by the farms had good hygienic quality  
407 based on total bacterial counts, STEC contamination occurred occasionally during milking,  
408 especially at times when fecal shedding was detected. STEC was detected more frequently from  
409 milk filters than from five subsamples of milk, suggesting that sampling could be targeted to  
410 milk filters, reducing the number of required subsamples and, subsequently, analysis costs.  
411 Despite *C. jejuni* being prevalent in cattle, representing both persistent and sporadic strains,  
412 almost none could be detected from milk or milk filters. Lack of detection was probably due to  
413 poor survival of *C. jejuni* in these sample matrices. Therefore, analysis of milk or milk filters  
414 may poorly indicate the risk of campylobacteriosis related to the consumption of raw milk,  
415 especially if laboratory analyses are delayed after sampling. This should be considered when  
416 planning a sampling regime for monitoring. Furthermore, detection of various *C. jejuni* strains  
417 and highly pathogenic serogroups of STEC in the Finnish herds implies that categorization of  
418 farms as positive or negative may be arbitrary for targeted risk management. Instead, cost-  
419 effective on-farm hygienic practices should be promoted on all farms that produce raw drinking  
420 milk to reduce the contamination pressure on milk, although the practices alone cannot prevent  
421 contamination. Because pathogen contamination occurred despite rigorous on-farm hygienic  
422 measures, and pathogen detection from milk and milk filters appeared challenging, the health  
423 risks of raw milk can only effectively be avoided by heat treatment of the milk before  
424 consumption.

## 425 **Materials and Methods**

### 426 **Farms.**

427 Three Finnish dairy farms were recruited to the study on the basis that fecal samples of  
428 their cattle had previously tested positive for both STEC O157:H7 and *C. jejuni*. Before this  
429 study, STEC O157:H7 had been detected on farm 1 over two years previously (in October 2011  
430 and January 2012), on farm 2 four months previously (in October 2013), and on farm 3 two  
431 months previously (in December 2013). Since the first detection of STEC O157:H7, the farms  
432 had followed national policies by implementing rigorous hygienic measures aimed at reducing  
433 on-farm transmission of this pathogen. These measures included continual disinfection of  
434 drinking and feeding troughs, along with enhanced hygiene during milking and handling of feed  
435 and manure. All farms were located in southern Finland and housed milking cows in warm  
436 freestall barns. The cattle were pastured in summer (fenced off from natural waters) and reared  
437 indoors in winter. All new animal material was raised and silage produced on the farms. Farm 1  
438 housed 30 cows for pipeline milking in a parlor, whereas farms 2 and 3 both housed 60 cows in  
439 an automated milking system.

### 440 **Sampling, sample handling, and test portions.**

441 Each farm was sampled for a year between January 2014 and June 2015: 52–53 times for  
442 milk and milk filters and 11 times for feces, drinking troughs, and drinking water. All the  
443 samples were chilled immediately after collection and dispatched to the laboratory. Laboratory  
444 analyses were initiated as soon as possible, usually within 24 h of sampling. As an exception,  
445 milk filters were stored on farms after collection for up to 48 h, moistened with buffered peptone  
446 water, and dispatched to the laboratory with the milk samples. Sample containers were filled or  
447 airtight sample bags were used to avoid drying and extra air space, detrimental for the survival of

448 *Campylobacter*. All samples were examined in the national reference laboratory for STEC and  
449 thermophilic *Campylobacter* in food.

450 Milk samples (2 L) were collected from the bulk tanks after two days of milk  
451 accumulation, before voiding the tanks. Milk was examined as five subsamples of 25 mL. All  
452 replaceable filters of the milking machines were collected during the same milk accumulation  
453 period, 3–10 filters per sampling. Milk filters were longitudinally halved for STEC and  
454 *Campylobacter* analyses, and one to three halves were enriched as a sample in 225 or 450 mL of  
455 broth depending on their size.

456 Freshly voided feces of 5–10 animals were pooled into one fecal sample according to the  
457 contemporary sampling regime of the Finnish monitoring program for STEC (36). Fecal samples  
458 were taken separately from milking cows and juvenile cattle in the barn and examined as 10-g  
459 test portions. Drinking troughs were sampled with duplicate sponge swabs (Polywipe, Medical  
460 Wire & Equipment, Corsham, Wiltshire, UK), and duplicates were divided between STEC and  
461 *Campylobacter* analyses. A single swab from the drinking troughs was enriched in 90 mL of  
462 broth. Samples from drinking water (8 L) both in the barn and on the pastures were taken if the  
463 water sourced from a private supply, as was the case on farm 1. Drinking water was passed  
464 through 0.45- $\mu$ m membrane filters (GN-6 Metrical Membrane, Pall Corporation, Ann Arbor, MI,  
465 USA) as two subsamples of 4 L, and the filters were halved for STEC and *Campylobacter*  
466 analyses. Filter halves of a 4-L subsample were enriched in 100 mL or (for three or more halves)  
467 in 225 mL of broth.

468 **PCR screening and culture of STEC from milk and milk filters.**

469 Milk and milk filters were analyzed for STEC by ISO/TS 13136:2012 (37). After  
470 enrichment in modified tryptone soya broth supplemented with 12 mg/L acriflavin, milk and

471 filter samples were simultaneously subjected to DNA extraction and immunomagnetic separation  
472 (IMS). DNA was extracted from 1 mL (MasterPure kit, Epicentre, Madison, WI, USA) or 100  
473  $\mu$ L (iQ-Check STEC kit, Bio-Rad, Marnes-la-Coquette, France) of enriched sample broth and  
474 screened for the virulence genes *stx* and *eae* using real-time PCR (Taqman ISO assay, Life  
475 Technologies, Thermo Fisher Scientific, Carlsbad, CA, USA or iQ-Check STEC kit). To avoid  
476 PCR signal interference, milk fat and acriflavin-containing broth were carefully removed before  
477 DNA extraction by pipetting and centrifugation. PCR inhibition was monitored with an internal  
478 amplification control. A minimum of one sample positive for *stx* and *eae* per sampling was  
479 further analyzed for serogroups O157:H7, O26, O103, O145, O111, O121, and O45 using real-  
480 time PCR (iQ-Check STEC kit).

481 IMS (Dynabeads anti-*E. coli* O157, Life Technologies, Thermo Fisher Scientific, Oslo,  
482 Norway) was followed by plating onto selective agars: cefixime-tellurite sorbitol MacConkey  
483 agar with 5-bromo-4-chloro-3-indoxyl- $\beta$ -D-glucuronide (Harlequin, Lab M, Lancashire, UK)  
484 and CHROMagar STEC (CHROMagar, Paris, France). These plates were used for STEC  
485 detection throughout the study unless mentioned otherwise. The plates were screened for typical  
486 O157 colonies that were sorbitol and  $\beta$ -glucuronidase negative. To detect other STEC serogroups  
487 than the typical O157, 10  $\mu$ L of enriched sample was plated without IMS, and the plates were  
488 screened for typical non-O157 colonies that were sorbitol positive. Suspected non-O157 colonies  
489 were streaked onto CHROMagar STEC and screened for the virulence genes using real-time  
490 PCR.

491 **STEC culture from cattle feces, drinking troughs, and drinking water.**

492 Fecal samples were cultured for *E. coli* O157 by ISO 16654:2001, with the exceptions of  
493 enrichment for 6 h and selective agars (38). Swabs from drinking troughs and drinking water

494 were examined for STEC O157 by ISO/TS 13136:2012 with the enrichment in modified tryptone  
495 soya broth supplemented with 16 mg/L novobiocin (37). Swabs were enriched for 6 h, as an  
496 exception from the standard method. The enriched samples were subjected to IMS and cultured  
497 for the detection of typical STEC O157 without PCR screening. If STEC serogroups other than  
498 O157 were detected in the PCR screening of milk or milk filters, feces were additionally  
499 examined for that serogroup with IMS in one or two samplings.

#### 500 **Confirmation and characterization of STEC isolates.**

501 Suspected STEC isolates were biochemically confirmed as *E. coli*, tested for O-antigen  
502 agglutination (*E. coli* O157 Latex Test kit, Oxoid, Thermo Fisher Scientific, Basingstoke, UK or  
503 *E. coli* rabbit antisera for O26, O111, O104, O103, or O145, SSI Diagnostica, Hillerød,  
504 Denmark), and examined for the presence of *stx1*, *stx2*, *eae*, and *hlyA* by conventional multiplex  
505 PCR (39). *Stx*-positive isolates were subtyped using PFGE with *XbaI* digestion (40). Subtyping  
506 was performed for two isolates per positive milk, milk filter, or swab sample and one isolate per  
507 positive fecal sample. Gel images were analyzed using BioNumerics software (version 6.6;  
508 Applied Maths, Sint-Martens-Latem, Belgium). In PFGE fingerprints, a difference of one or  
509 more bands was designated as a different pulsotype. Similarities in PFGE fingerprints were  
510 calculated using the Dice coefficient with 1.5% optimization and 1.0% tolerance.

#### 511 **Analyses for *C. jejuni*.**

512 Feces, milk, milk filters, and swabs from drinking troughs were cultured for thermophilic  
513 *Campylobacter* spp. by ISO 10272-1:2006 and drinking water by ISO 17995:2005; both methods  
514 with the exception of enrichment for 24 h (41, 42). Species of suspect *Campylobacter* isolates  
515 were identified biochemically or by matrix-assisted laser desorption/ionization time-of-flight  
516 mass spectrometry (MALDI Biotyper, reference library version 4.0.0.1, 5627 main spectra

517 libraries, Bruker Daltonik, Bremen, Germany). *C. jejuni* isolates were subtyped using PFGE with  
518 *Sma*I digestion or (if non-digestible by *Sma*I) with *Kpn*I (43). Isolates were selected for PFGE  
519 and data were analyzed as described for STEC, but with 0.5% optimization and 1% tolerance.

520 **Whole-genome sequencing, assembly, and *in silico* typing.**

521 Based on pulsotypes, representative isolates were further selected for whole-genome  
522 sequencing. Altogether, sequences were obtained for 32 STEC O157, five STEC non-O157, and  
523 36 *C. jejuni* isolates (Table S1 and S2). After DNA extraction (PureLink Genomic DNA Mini  
524 Kit, Life Technologies, Thermo Fisher Scientific, Carlsbad, CA, USA or DNeasy Blood and  
525 Tissue Kit, Qiagen, Hilden, Germany), genomic DNA libraries were prepared (Nextera XT or  
526 Nextera Flex Kit, Illumina, San Diego, CA, USA) and subjected to paired-end sequencing (250-  
527 bp reads) on HiSeq or MiSeq (Illumina) platforms. Reads were further subjected to quality  
528 control, *de novo* assembly, and MLST by INNUca pipeline (version 3.1) (44). MLST types were  
529 derived from the PubMLST website (<https://pubmlst.org/>) (45–47). *In silico* serotypes, virulence  
530 genes for pathotyping *E. coli*, and *stx* subtypes were obtained for STEC isolates by reads  
531 mapping against the reference genes, respectively, using seq\_typer (version 0.1), patho\_typer  
532 (version 0.3), and ReMatCh (version 3.2) with the *stx* subtype reference sequences from the  
533 VirulenceFinder database (48–52). ReMatCh was run with initial parameters --  
534 minGeneCoverage 100, --minGeneIdentity 100, --minCovPresence 1, and --minCovCall 1,  
535 followed by manual curation of the positive hits to resolve presumably cross-reactant subtypes.  
536 Clade typing of STEC O157 isolates was performed as originally defined by Manning et al. (15),  
537 using eight definitive SNP positions according to Yokoyama et al. (53). Reads were first mapped  
538 against eight reference genes from the Sakai strain (GenBank accession no. NC\_002695.1) (54,



539 55) by ReMatCh with default parameters, and definitive SNPs were then determined from the  
540 resulting alignments.

541 **Whole-genome multilocus sequence typing.**

542 To assess genomic variation of the data sets in wider or global context, draft genome  
543 assemblies were subjected to wgMLST using chewBBACA software (version 2.0.8) with the  
544 chewBBACA schemas for *E. coli* and *C. jejuni* (16, 17, 56, 57). Resulting allelic profiles were  
545 concatenated with the profiles representing the same MLST ST from the INNUENDO database  
546 (16, 17). After extracting the core loci, PWDs were calculated and used to infer a minimum  
547 spanning tree in PHYLOViZ Online (<https://online.phyloviz.net/>) that uses the goeBURST  
548 algorithm (58).

549 Analyses were performed for four data sets: (i) Allelic profiles of 32 STEC O157:H7  
550 isolates originating from all three farms were compared with 482 ST-11 profiles from the  
551 INNUENDO database (Data set S1). (ii) Allelic profiles of six *C. jejuni* isolates from the three  
552 farms were compared with 436 ST-45 profiles from the INNUENDO database (Data set S2). (iii)  
553 Allelic profiles of three *C. jejuni* isolates from farm 1 were compared with four profiles from the  
554 database, all representing ST-1080 (Data set S3). (iv) Allelic profiles of five *C. jejuni* isolates  
555 from farm 3 were compared with 66 ST-883 profiles from the database (Data set S4).

556 **Phylogenomics of STEC O157:H7 isolates.**

557 Based on PWDs in wgMLST, the closest foreign isolate to STEC O157:H7 farm isolates  
558 was selected as an outgroup for further analyses. Its assembled genome sequence was obtained  
559 from EnteroBase (accession no. ESC\_FA0769AA) and reads from the European Nucleotide  
560 Archive (accession no. SRR4787064) (57, 59). The assembled genome sequences of 32 STEC  
561 O157:H7 farm isolates and the outgroup were annotated with Prokka (version 1.12), followed by

562 pangenome analysis with Roary (version 3.8.0) to select an in-group reference genome with the  
563 highest number of coding sequences (60, 61).

564 SNPs were then called from the sequencing reads of 31 genomes against the assembled  
565 reference genome (Ec\_Farm2\_2014-03\_C1) and core SNPs were extracted using Snippy (version  
566 4.0-dev) (62). The analysis was performed both with and without the outgroup  
567 (ESC\_FA0769AA). The full sequence alignment of core SNPs and invariant sites was then  
568 analyzed for recombination using Gubbins (version 2.3.1), and recombinant regions were  
569 masked from the alignment by maskrc-svg (version 0.4) (63, 64). From the recombination-free  
570 alignment, a maximum likelihood tree was constructed using IQ-TREE (version 1.5.5) with  
571 automatic model selection and both the SH-aLRT test and UFBoot bootstrapping with 1000  
572 replicates (65–67). An automatically selected substitution model K3Pu+R7 assumed three  
573 substitution types, unequal base frequencies, and a free rate of heterogeneity across sites. To test  
574 the validity of the molecular clock assumption, a temporal signal was investigated from the  
575 resulting phylogeny by root-to-tip analysis in TempEst (version 1.5.1) with the best-fit root  
576 option (68).

#### 577 **Analysis of risk factors for milk contamination by *stx*.**

578 Simultaneously with each milk sampling, the farmers filled out a questionnaire on  
579 deviations from normal farm practices during the preceding week. The questionnaire data  
580 consisted of 26 questions (i.e. variables), each with 157 binary answers (i.e. observations for a  
581 single variable; presence/absence data, three farms for 52–53 weeks). Excluding missing data,  
582 each question contained 152 binary answers. Questions were excluded from the analysis based  
583 on: (i) zero inflation with less than 5% of presence data (16 questions excluded), (ii) biological  
584 irrelevance to milk contamination (three questions excluded: data on juvenile cattle and on

585 unspecified farm visitors), (iii) heterogeneous reporting practices between the farms (one  
586 question excluded: changes in staff), or (iv) notable collinearity with another variable (one  
587 question excluded: questionnaire data on udder health).

588 In addition to the questionnaire, total bacterial counts (variable '*Bact*') and somatic cell  
589 counts (variable '*Cell*') were included in the analysis as indicators for milk hygiene and udder  
590 health, respectively. These results had been obtained by dairy laboratories in separate samplings  
591 from our study respectively using flow cytometry (BactoScan FC, Foss, Hillerød, Denmark) and  
592 fluoro-opto-electronic methods (69). Therefore, respectively 89 (57%) of *Bact* and 93 (59%) of  
593 *Cell* results were analyzed from the same bulk tank content by the dairy laboratories and this  
594 study. The missing values were either (i) replaced with plausible values from temporally close  
595 results (49 *Bact* and 57 *Cell* values) or (ii) multiply imputed within the model from a distribution  
596 exploiting the observed values. One large value was observed for both variables *Bact* and *Cell*,  
597 but their removal as outliers could not be justified biologically.

598 To include meteorological variables, weather observations were retrieved from the  
599 nearest weather station of each farm, considering distance to the coast (70). Temperature and  
600 humidity were hypothesized to mediate milk contamination by affecting conditions for bacterial  
601 survival and growth in the barn and on pastures. Number of rainy days was used as an indicator  
602 for humidity because of its robustness to seasonal effect.

603 Altogether, nine explanatory variables were included in the model (M1, Table 3) after  
604 data exploration (71). Continuous variables (*Bact*, *Cell*, and *Temp*) were standardized ( $[x_i - \mu]/\sigma$ )  
605 before the analysis.

$$\begin{aligned} \text{logit}(\theta_{ij}) = & \beta_{0j} + \beta_1 \text{Sale}_i + \beta_2 \text{Cleanse}_i + \beta_3 \text{Feed}_i + \beta_4 \text{Pastured}_i + \beta_5 \text{Maint}_i \\ & + \beta_6 \text{Rain}_i + \beta_7 \text{Temp}_i + \beta_8 \text{Bact}_i + \beta_9 \text{Cell}_i \end{aligned} \quad (M1)$$

$$y_{ij}|\theta_{ij} \sim \text{Bin}(n_{ij}, \theta_{ij}),$$

606 where  $y_{ij}$  is the number of *stx*-positive milk subsamples in sampling i, farm j

607  $n_{ij}$  is the number of milk subsamples in sampling i, farm j

608  $\theta_{ij}$  is the proportion of *stx*-positive milk subsamples in sampling i, farm j

$$\text{Sale}_{ij} \sim B(p_1), \text{Cleanse}_{ij} \sim B(p_2), \text{Feed}_{ij} \sim B(p_3), \text{Pastured}_{ij} \sim B(p_4), \text{Maint}_{ij} \sim B(p_5)$$

$$\text{Bact}_{ij} \sim \text{Poisson}(\lambda_1), \text{Cell}_{ij} \sim \text{Poisson}(\lambda_2)$$

609 with uninformative priors

$$p(\beta_{0j}) = N(0, 10^3), \quad j = 1, 2, 3$$

$$p(\beta_k) = N(0, 10^3), \quad k = 1, \dots, 9$$

$$p(p_l) = \text{Beta}(1, 1), \quad l = 1, \dots, 5$$

$$p(\lambda_m) = \text{Gamma}(10^{-2}, 10^{-2}), \quad m = 1, 2$$

610 Data were analyzed using the R software (version 3.4.4) and JAGS software (version  
611 4.3.0) via rjags package (version 4–6) (72–74). Markov Chain Monte Carlo simulations were run  
612 using 10 000 iterations in two chains with thinning of 2 and adaptation of 200 iterations.  
613 Convergence and autocorrelation were checked from the resulting chains. Posterior probabilities  
614  $p(\beta_k > 0)$  and 95% credibility intervals were calculated for  $\beta_k$ . Explanatory variables were  
615 interpreted to increase milk contamination if  $p(\beta_k > 0) > 0.95$ , to decrease milk contamination if  
616  $p(\beta_k > 0) < 0.05$ , and to have no effect on milk contamination if  $0.05 \leq p(\beta_k > 0) \leq 0.95$ .

617 **Data availability.**

618 *De novo* genome assemblies (Data set S5), and data and code for R are available from the  
619 Zenodo repository (<http://doi.org/10.5281/zenodo.1467142>).

620           **Accession numbers.**

621           Whole-genome sequencing reads were submitted to the European Nucleotide Archive  
622           under project accession numbers PRJEB28441 or PRJEB27020 (Table S1 and S2).

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640           the authors and not the official position of EFSA, which is not responsible for any use that may  
641           be made of the information they contain.

642 **Author contribution**

643 A.J., H.C., S.H., M.L., and M.H. designed the study, data collection, and microbiological  
644 analyses. A.J. and J.R. conducted the statistical analyses. A.J., M.R., and J.I. contributed to the  
645 whole-genome sequencing and genomic analyses. A.J. analyzed the data and wrote the  
646 manuscript. All authors participated in interpreting the results and revising the manuscript, and  
647 approved the final version.

648 **Disclaimer**

649 M.R. is currently employed with the EFSA in its BIOCONTAM Unit that provides  
650 scientific and administrative support to EFSA's scientific activities in the area of Microbial Risk  
651 Assessment. The positions and opinions presented in this article are those of the authors alone  
652 and are not intended to represent the views or scientific works of EFSA.

653 **Conflict of interest**

654 Authors declare no conflicting interests.

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878



879 **Tables**

880 TABLE 1 Occurrence of Shiga toxin-producing *Escherichia coli* (STEC) and *Campylobacter jejuni* in feces, drinking troughs, milk, and milk  
 881 filter samples on three dairy farms during one year. No. of positive samples (or subsamples for milk) per no. of analyzed samples (%)

Analysis	Farm 1	Farm 2	Farm 3	In total
STEC O157:H7 culture				
Feces, in total	1/87 (1)	34/85 (40)	9/85 (11)	44/257 (17)
Feces, milking cows	0/35 (0)	22/69 (32)	6/60 (10)	28/164 (17)
Feces, juvenile cattle	1/52 (2)	12/16 (75)	3/25 (12)	16/93 (17)
Drinking troughs	0/85 (0)	4/65 (6)	3/49 (6)	7/199 (4)
Milk	0/260 (0)	0/260 (0)	0/269 (0)	0/789 (0)
Milk filters	0/141 (0)	8/318 (3)	4/173 (2)	12/632 (2)
STEC non-O157 culture				
Milk	0/260 (0)	0/260 (0)	2/269 (1) <sup>b</sup>	2/789 (<1)
Milk filters	0/141 (0)	1/318 (<1) <sup>a</sup>	5/173 (3) <sup>c</sup>	6/632 (1)
PCR screening for STEC in milk: <i>stx</i>				
Milk	9/260 (3)	25/260 (10)	18/269 (7)	52/789 (7)
Milk filters	21/141 (15)	142/317 (45)	70/173 (40)	233/631 (37)
PCR screening for STEC in milk filters: <i>stx</i> and <i>eae</i>				
Milk	2/260 (1)	15/260 (6)	15/269 (6)	32/789 (4)
Milk filters	6/141 (4)	108/317 (34)	64/173 (37)	178/631 (28)
<i>C. jejuni</i> culture				
Feces, in total	14/87 (16)	48/85 (56)	74/85 (87)	136/257 (53)
Feces, milking cows	11/35 (31)	46/69 (67)	58/60 (97)	115/164 (70)
Feces, juvenile cattle	3/52 (6)	2/16 (13)	16/25 (64)	21/93 (23)
Drinking troughs	0/85 (0)	1/65 (2)	9/49 (18)	10/199 (5)
Milk	0/260 (0)	0/260 (0)	0/265 (0)	0/785 (0)
Milk filters	0/140 (0)	0/318 (0)	1/173 (1)	1/631 (<1)

882 <sup>a</sup>serotype O182:H25.

883 <sup>b</sup>serotype O121:H19.

884 <sup>c</sup>serotype O26:H11.

885 TABLE 2 Occurrence of Shiga toxin-producing *Escherichia coli* (STEC) and *Campylobacter jejuni* in fecal samples on three dairy farms in  
886 different samplings from February 2014 through May 2015. No. of positive fecal samples (%) per sampling<sup>a</sup>

Farm 1	Feb 2014	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Dec	Feb 2015
<b>STEC O157:H7</b>											
Cows	0	0	0	0	0	0	0	0	0	0	0
Juveniles	0	0	0	0	0	0	0	1 (17)	0	0	0
<b><i>C. jejuni</i></b>											
Cows	3 (60)	1 (25)	0	3 (100)	0	0	0	0	2 (67)	1 (33)	0
Juveniles	0	2 (40)	0	0	0	1 (17)	0	0	0	0	0
Farm 2	Mar 2014	Apr	May	Jun	Jul	Aug	Sep	Nov	Jan 2015	Mar	May
<b>STEC O157:H7</b>											
Cows	7 (88)	6 (86)	4 (57)	1 (17)	0	1 (17)	3 (60)	0	0	0	0
Juveniles	5 (100)	2 (50)	3 (100)	1 (100)	NA	0	1 (50)	NA	NA	NA	NA
<b><i>C. jejuni</i></b>											
Cows	5 (63)	6 (86)	7 (100)	5 (83)	7 (100)	6 (100)	3 (60)	3 (50)	0	0	4 (80)
Juveniles	1 (20)	0	0	0	NA	0	1 (50)	NA	NA	NA	NA
Farm 3	Feb 2014	May	Jun	Jul	Aug	Sep	Oct	Nov	Jan 2015	Mar	May
<b>STEC O157:H7</b>											
Cows	0	0	0	6 (100)	0	0	0	0	0	0	0
Juveniles	1 (20)	2 (50)	0	0	0	0	0	0	NA	NA	NA
<b>STEC O26:H11</b>											
Cows	NA	NA	NA	NA	NA	3 (50)	NA	NA	NA	0	1 (17)
Juveniles	NA	NA	NA	NA	NA	1 (50)	2 (67) <sup>b</sup>	1 (14) <sup>b</sup>	NA	NA	NA
<b><i>C. jejuni</i></b>											
Cows	1 (100)	5 (83)	5 (100)	6 (100)	6 (100)	5 (83)	6 (100)	6 (100)	6 (100)	6 (100)	6 (100)
Juveniles	4 (80)	4 (100)	0	0	0	2 (67)	1 (33)	5 (71)	NA	NA	NA

887 <sup>a</sup>NA, not analyzed.

888 <sup>b</sup>unspecific detection with O157 IMS.

TABLE 3 Explanatory variables and their modeled effects on the contamination of bulk tank milk by *stx* gene that indicates contamination by STEC bacteria. Data consisted of weekly questionnaire answers on farm practices, meteorological observations, and laboratory results on milk quality on three dairy farms during one year

Variable		Posterior probability $p(\beta_k > 0)$	95% posterior credibility interval	Effect
<i>Farm</i>	fixed effect with three levels			
<i>Sale</i>	culling i.e. removal of cows from the dairy herd	0.0003	-62.63, -3.66	negative
<i>Cleanse</i>	major cleansing in the barn	0.005	-4.93, -0.67	negative
<i>Feed</i>	abnormalities in feed	0.68	-0.58, 0.95	no
<i>Pastured</i>	pasturing of milking cows	0.01	-1.96, -0.32	negative
<i>Maint</i>	maintenance and breaks of the milking equipment	0.06	-2.76, 0.07	no
<i>Rain</i>	number of rainy days ( $\geq 1$ mm) during six days preceding the sampling	0.52	-0.20, 0.20	no
<i>Temp</i>	average outdoor temperature ( $^{\circ}\text{C}$ ) during six days preceding the sampling	1.00	0.49, 1.25	positive
<i>Bact</i>	total bacterial counts (1000 cfu/mL)	0.78	-0.13, 0.26	no
<i>Cell</i>	somatic cell counts (1000 /mL)	0.41	-0.34, 0.24	no

## Figure legends

FIGURE 1 Detection rates of STEC from the feces of milking cows, milk subsamples, and milk filters in different samplings on three dairy farms between January 2014 and June 2015. STEC non-O157 isolate that harbored only *stx* was additionally recovered from feces on farm 2 in May 2015.

FIGURE 2 Maximum likelihood tree based on genome-wide SNPs of 32 STEC O157:H7 isolates, collected on three dairy farms from October 2011 through November 2014. SNPs were called against the in-group reference (Ec\_Farm2\_2014-03\_C1). An outgroup strain (ESC\_FA0769AA), collected in the UK in 2016, was included in the analysis. The tree is

904 unrooted and UFBoot support values  $\geq 95\%$  are shown. Branch lengths are ignored and only  
905 branches with support values  $\geq 80$  are shown. Lineages are colored by farms and branches of the  
906 in-group reference and outgroup are denoted by dashed lines. The tree was visualized using  
907 iTOL (75).  
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